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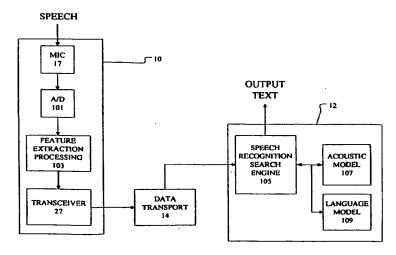
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#### (54) Title: DISTRIBUTED SPEECH RECOGNITION FOR MOBILE COMMUNICATION DEVICES



(57) Abstract: A method of performing speech recognition, and a mobile computing device (10) implementing the same, are disclosed. The method includes receiving (205) audible speech at a microphone (17) of the mobile computing device. The audible speech is converted (210) into speech signals at the mobile computing device. Also at the mobile computing device, preliminary speech recognition functions are performed (215) on the speech signals to obtain intermediate speech recognition results. Then, the intermediate speech recognition results are transmitted (220) from the mobile computing device (10) to a second computing device (12) located remotely from the mobile computing device for completion of the speech recognition process (230).

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# DISTRIBUTED SPEECH RECOGNITION FOR MOBILE COMMUNICATION DEVICES

## BACKGROUND OF THE INVENTION

The present invention relates to personal mobile computing devices commonly known as handheld portable computers. More particularly, the present invention relates to a system and method for enhancing speech recognition performed with the use of mobile computing devices.

Mobile devices are small electronic computing devices sometimes referred to as personal digital assistants (PDAs). Many of such mobile devices are handheld devices, or palm-size devices, which comfortably fit within the hand. One commercially available mobile device is sold under the trade name HandHeld PC (or H/PC) having software provided by Microsoft Corporation of Redmond, Washington.

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mobile device includes the Generally, processor, random access memory (RAM), and an input device such as a keyboard and a display, wherein the keyboard can be integrated with the display, such as a touch sensitive display. A communication interface is commonly is optionally provided and communicate with a desktop computer. A replaceable or device. mobile the rechargeable battery powers Optionally, the mobile device can receive power from an external power source that overrides or recharges the built-in battery, such as a suitable AC or DC adapter, or a powered docking cradle.

In one common application, the mobile device is used in conjunction with the desktop computer. For example, the user of the mobile device may also have access to, and use, a desktop computer at work or at

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home. The user typically runs the same types of applications on both the desktop computer and on the mobile device. Thus, it is quite advantageous for the mobile device to be designed to be coupled to the desktop computer to exchange information with, and share information with, the mobile device.

As the mobile computing device market continues grow, new developments can be expected. integrated with devices can be mobile example. cellular or digital wireless communication technology provide a mobile computing device which also Thus, cellular or functions as a mobile telephone. digital wireless communication technology can provide the communication link between the mobile device and the desktop (or other) computer. Further, speech recognition can be used to record data or to control functions of one or both of the mobile computing desktop computer, with the and the device speaking into a microphone on the mobile device and with signals being transmitted to the desktop computer based upon the speech detected by the microphone.

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Several problems arise when attempting to perform speech recognition, at the desktop computer, of words spoken into a remote microphone such as a microphone positioned on a mobile device. First, the signal-tonoise ratio of the speech signals provided by the distance between microphone drops the as microphone and the user's mouth increases. With a typical mobile device being held in a user's palm up to a foot from the user's mouth, the resulting signalto-noise ratio drop may be a significant recognition obstacle. Also, internal noise within the mobile device lowers the signal-to-noise ratio of the

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speech signals due to the close proximity of the internal noise to the microphone which is typically positioned on a housing of the mobile device. Second, due to bandwidth limitations of digital and other communication networks such as wireless communications networks, the speech signals received at the desktop computer will be of lower quality, as compared to speech signals from a desktop microphone. Thus, with different desktop and telephony bandwidths, speech recognition results will vary when using a mobile computing device microphone instead of a desktop microphone.

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#### SUMMARY OF THE INVENTION

A method of performing speech recognition, and a 15 mobile computing device implementing the same, are disclosed. The method includes receiving audible speech at a microphone of the mobile computing device. The audible speech is converted into speech signals at the mobile computing device. Also at the mobile 20 computing device, preliminary speech recognition functions are performed on the speech signals to obtain intermediate speech recognition results. Then, the intermediate speech recognition results are transmitted from the mobile computing device to a 25 second computing device located remotely from the mobile computing device for completion of the speech recognition process.

In some embodiments of the invention, the mobile computing device performs the same preliminary speech recognition functions on the speech signals as would be performed at the second computing device. The intermediate speech recognition results can be speech

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recognition features extracted from the speech signals. The features can include, for example, Mel-Frequency Cepstrum Coefficients, Vector Quantized (VQ) indices, Hidden Markov Modeling (HMM) scores, HMM state output probability density functions, Cepstral coefficients, or other types of speech recognition features which can be extracted from the speech signals.

features from the mobile Transmitting the computing device to the second computing device, instead of transmitting the speech signals themselves for speech recognition at the second computing device, allows uniform speech recognition models to be used regardless of whether the communication network is wide band or narrow band. Further, in the event that the communication network has a narrower bandwidth than does the mobile computing device microphone, the wider bandwidth speech information is not lost when transmitting the speech recognition features across the narrower bandwidth communication network.

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### BRIEF DESCRIPTION OF THE DRAWINGS

FIG. 1 is a simplified block diagram illustrating one embodiment of a mobile device in accordance with the present invention.

FIG. 2 is a more detailed block diagram of one embodiment of the mobile device shown in FIG. 1.

FIG. 3 is a simplified pictorial illustration of one embodiment of the mobile device in accordance with the present invention.

FIG. 4 is a simplified pictorial illustration of another embodiment of the mobile device in accordance with the present invention.

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FIG. 5 is a block diagram of an exemplary embodiment of a desktop computer in which portions of the speech recognition process of the invention can be implemented.

FIG. 6 is a flow diagram illustrating methods of the present invention.

FIG. 7 is a block diagram illustrating a speech recognition system in accordance with embodiments of the invention.

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## DETAILED DESCRIPTION OF ILLUSTRATIVE EMBODIMENTS

is a block diagram of an exemplary portable computing device, herein a mobile device 10 accordance with the present invention. FIG. illustrates that, in one embodiment, the mobile device 10 is suitable for connection with, and to receive information from, a desktop computer 12, a transport 14, or both. The data transport 14 can be a wireless transport such as a paging network, cellular digital packet data (CDPD), FM-sideband, or other 10 suitable wireless communications. However, it should also be noted that the mobile device 10 may not be equipped to be connected to the desktop computer 12, and the present invention applies regardless of whether the mobile device 10 is provided with this 15 Mobile device 10 can be a personal capability. hand held portable digital assistant (PDA) or a computer having cellular or digital wireless phone capabilities and adapted to perform both conventional PDA functions and to serve as a wireless telephone. 20 In other embodiments, data transport 14 is a cable network, a telephone network, or other non-wireless communication networks.

In an exemplary embodiment, mobile device 10 includes a microphone 17, an analog-to-digital (A/D) converter 15 and speech recognition programs 19. In response to verbal commands, instructions or information from a user of device 10, microphone 17 provides speech signals which are digitized by A/D converter 15. Speech recognition programs 19 perform feature extraction functions on the digitized speech signals to obtain intermediate speech recognition results. Using antenna 11, device 10 transmit the

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intermediate speech recognition results over transport 14 to desktop computer 12 where additional speech recognition programs are used to complete the speech recognition process. The speech recognition feature extraction aspects of the present invention are discussed below in greater detail.

In some embodiments, mobile device 10 includes one or more other application programs 16 and an object store 18. The application programs 16 can be, for example, a personal information manager (PIM) 16A that stores objects related to a user's electronic scheduling calendaring or(e-mail) and mail information. The application programs 16 can also include a content viewer 16B that is used to view information obtained from a wide-area network, such as the Internet. In one embodiment, the content viewer 16B is an "offline" viewer in that information is stored primarily before viewing, wherein the user does not interact with the source of information in real time. In other embodiments, mobile device 10 operates in a real time environment wherein the transport 14 PIM 16A, content provides two-way communication. viewer 16B and object store 18 are not required in all embodiments of the invention.

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In embodiments including PIM 16A, content viewer 16B and object store 18, the wireless transport 14 can also be used to send information to the mobile device 10 for storage in the object store 18 and for use by the application programs 16. The transport 14 receives the information to be sent from an information source provider 13, which, for example, can be a source of news, weather, sports, traffic or local event information. Likewise, the information source provider

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13 can receive e-mail and/or scheduling information from the desktop computer 12 to be transmitted to the 14. through the transport mobile device 10 information from the desktop computer 12 can be supplied to the information source provider 13 through any suitable communication link, such as a direct modem connection. In another embodiment, the desktop computer 12 and the information source provider 13 can be connected together forming a local area network (LAN) or a wide area network (WAN). Such networking environments are commonplace in offices, enterprisewide computer network Intranets and the Internet. If desired, the desktop computer 12 can also be directly connected to the transport 14.

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It is also worth noting that, in one embodiment, the mobile device 10 can be coupled to the desktop computer 12 using any suitable, and commercially available, communication link and using a suitable instance, For communications protocol. embodiment, the mobile device 10 communicates with the desktop computer 12 with a physical cable which communicates using a serial communications protocol. Other communication mechanisms include infra-red (IR) communication and direct modem communication.

It is also worth noting that the mobile device 10, in one embodiment, can be synchronized with the desktop computer 12. In that instance, properties of objects stored in object store 18 are similar to properties of other instances of the same objects stored in an object store on the desktop computer 12 30 or on the mobile device 14. Thus, for example, when one instance of an object stored in the object store on the desktop computer 12, the second instance of

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that object in the object store 18 of the mobile device 10 is updated the next time the mobile device 10 is connected to the desktop computer 12 so that both instances of the same object contain up-to-date data. This is commonly referred to as synchronization. synchronization, accomplish order to synchronization components run on both the mobile desktop computer 12. and the device with communicate synchronization components another through well defined interfaces to manage communication and synchronization.

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FIG. 2 is a more detailed block diagram of the mobile device 10. As shown, the mobile device 10 includes a processor 20, memory 22, input/output (I/O) components 24, a desktop computer communication interface 26, transceiver 27 and antenna 11. In one embodiment, these components of the mobile device 10 are coupled for communication with one another over a suitable bus 28. Although not shown in FIG. 2, mobile device 10 includes microphone 17 as illustrated in FIG. 1 and discussed below with reference to FIGS. 3-7.

Memory 22 is implemented as non-volatile electronic memory such as random access memory (RAM) with a battery back-up module (not shown) such that information stored in memory 22 is not lost when the general power to the mobile device 10 is shut down. A portion of memory 22 is allocated as addressable memory for program execution, while the remaining portion of memory 22 can be used for storage, such as to simulate storage on a disk drive.

Memory 22 includes an operating system 30, the application programs 16 (such as PIM 16A and speech

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recognition programs 19 discussed with respect to FIG. During operation, the 1) and the object store 18. operating system 30 is loaded into, and executed by, the processor 20 from memory 22. The operating system 30, in one embodiment, is a Windows CE brand operating available from Microsoft commercially Corporation. The operating system 30 can be designed for mobile devices, and implements features which can be utilized by PIM 16A, content viewer 16B and speech recognition functions 19 through a set of exposed 10 application programming interfaces and methods. objects in object store 18 are maintained by PIM 16A, content viewer 16B and the operating system 30, at least partially in response to calls to the exposed application programming interfaces and methods. 15

The I/O components 24, in one embodiment, are provided to facilitate input and output operations from the user of the mobile device 10. The desktop computer communication interface 26 is optionally provided as any suitable, and commercially available, communication interface. The interface 26 is used to communicate with the desktop computer 12 when wireless transceiver 27 is not used for that purpose.

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The transceiver 27 is a wireless or other type of transceiver adapted to transmit speech signals or 25 intermediate speech recognition results over transport In embodiments in which transceiver 27 is a intermediate speech transceiver, the wireless recognition results can be transmitted using antenna Transceiver 27 can also transmit other data over 30 In some embodiments, transceiver 27 transport 14. receives information from desktop computer 12, the information source provider 13, or from other mobile

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or non-mobile devices or phones. The transceiver 27 is coupled to the bus 28 for communication with the processor 20 and the object store 18 to store information received from transport 14.

A power supply 35 includes a battery 37 for powering the mobile device 10. Optionally, the mobile device 10 can receive power from an external power source 41 that overrides or recharges the built-in battery 37. For instance, the external power source 41 can include a suitable AC or DC adapter, or a power docking cradle for the mobile device 10.

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FIG. 3 is a simplified pictorial illustration of one embodiment of the mobile device 10 which can be used in accordance with the present invention. In this embodiment, in addition to antenna 11 and microphone 17, mobile device 10 includes a miniaturized keyboard 32, a display 34, a stylus 36, a second microphone 85 and a speaker 86. In the embodiment shown in FIG. 3, the display 34 is a liquid crystal display (LCD) which uses a contact sensitive display screen in conjunction with the stylus 36. The stylus 36 is used to press or contact the display 34 at designated coordinates to The user input functions. certain accomplish implemented is keyboard 32 miniaturized miniaturized alpha-numeric keyboard, with any suitable and desired function keys which are also provided for accomplishing certain user input functions.

Microphone 17 is positioned on a distal end of antenna 11. Antenna 11 is in turn adapted to rotate toward the mouth of the user, thereby reducing the distance between the mouth of the user and microphone 17 while mobile device 10 is held in the palm of the user's hand. As noted above, reducing this distance

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helps to increase the signal-to-noise ratio of the speech signals provided by the microphone. Further, placement of microphone 17 at the tip of antenna 11 moves the microphone from the housing of mobile device 10. This reduces the effects of internal device noise on the signal-to-noise ratio. While in some embodiments of the invention microphone 17 is located at the distal end of antenna 11, in other embodiments, microphone 17 can be placed at other positions on antenna 11.

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In some embodiments, mobile device 10 also includes second microphone 85, which can be positioned on the housing of mobile device 10. Providing a second microphone 85 which is distanced from first microphone 17 enhances performance of the resulting microphone array when the two microphones are used together. In some embodiments, speaker 86 is included to allow mobile device 10 to be used as a mobile telephone.

simplified another is FIG. 20 illustration of the mobile device 10 in accordance with another embodiment of the present invention. The mobile device 10, as illustrated in FIG. 4, includes some items which are similar to those described with respect to FIG. 3, and are similarly numbered. For 25 instance, the mobile device 10, as shown in FIG. 4, also includes microphone 17 positioned on antenna 11 and speaker 86 positioned on the housing of the 10 includes touch mobile device device. Also, sensitive display 34 which can be used, in conjunction 30 with the stylus 36, to accomplish certain user input functions. It should be noted that the display 34 for the mobile devices shown in FIGS. 3 and 4 can be the

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same size, or of different sizes, but will typically be much smaller than a conventional display used with a desktop computer. For example, the displays 34 shown in FIGS. 3 and 4 may be defined by a matrix of only 240x320 coordinates, or 160x160 coordinates, or any other suitable size.

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The mobile device 10 shown in FIG. 4 also includes a number of user input keys or buttons (such as scroll buttons 38 and/or keyboard 32) which allow the user to enter data or to scroll through menu options or other display options which are displayed on display 34, without contacting the display 34. In addition, the mobile device 10 shown in FIG. 4 also includes a power button 40 which can be used to turn on and off the general power to the mobile device 10.

It should also be noted that in the embodiment illustrated in FIG. 4, the mobile device 10 includes a hand writing area 42. Hand writing area 42 can be used in conjunction with the stylus 36 such that the user can write messages which are stored in memory 22 for later use by the mobile device 10. In one embodiment, the hand written messages are simply stored in hand written form and can be recalled by the user and displayed on the display 34 such that the user can review the hand written messages entered into the mobile device 10. In another embodiment, the mobile device 10 is provided with a character recognition module such that the user can enter alpha-numeric information into the mobile device 10 by writing that alpha-numeric information on the area 42 with the stylus 36. In that instance, the character recognition module in the mobile device 10 recognizes the alphanumeric characters and converts the characters into

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computer recognizable alpha-numeric characters which can be used by the application programs 16 in the mobile device 10.

FIG. 5 and the related discussion are intended to provide a brief, general description of a suitable 5 desktop computer 12 in which portions of the invention Although not required, implemented. be invention will be described, at least in part, in the general context of computer-executable instructions, such as program modules, being executed by a personal 10 computer 12 or mobile device 10. Generally, program modules include routine programs, objects, components, data structures, etc. that perform particular tasks or data types. abstract implement particular referred to as a desktop computer, the computing 15 environment illustrated in FIG. 5 can be implemented in other non-desktop computers. Moreover, those skilled in the art will appreciate that desktop computer 12 may be implemented with other computer including multiprocessor configurations, 20 systems, microprocessor-based or programmable consumer mainframe minicomputers, electronics, network PCs, computers, and the like. The invention may also be practiced in distributed computing environments where tasks are performed by remote processing devices that 25 are linked through a communications network. In a distributed computing environment, program modules may be located in both local and remote memory storage devices.

With reference to FIG. 5, an exemplary system for implementing desktop computer 12 includes a general purpose computing device in the form of a conventional personal computer, including processing unit 48, a

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system memory 50, and a system bus 52 that couples various system components including the system memory 50 to the processing unit 48. The system bus 52 may be any of several types of bus structures including a memory bus or memory controller, a peripheral bus, and of a variety of bus using any architectures. The system memory 50 includes read only memory (ROM) 54 and random access memory (RAM) 55. A basic input/output system (BIOS) 56, containing the basic routine that helps to transfer information between elements within the desktop computer 12, such as during start-up, is stored in ROM 54. The desktop computer 12 further includes a hard disk drive 57 for reading from and writing to a hard disk (not shown), a magnetic disk drive 58 for reading from or writing to removable magnetic disk 59, and an optical disk drive 60 for reading from or writing to a removable optical disk 61 such as a CD ROM or other optical media. The hard disk drive 57, magnetic disk drive 58, optical disk drive 60 are connected to the system bus 52 by a hard disk drive interface 62, magnetic disk drive interface 63, and an optical drive interface 64, respectively. The drives and the associated computerreadable media provide nonvolatile storage of computer structures, program instructions, data readable modules and other data for the desktop computer 12.

Although the exemplary environment described herein employs a hard disk, a removable magnetic disk 59 and a removable optical disk 61, it should be appreciated by those skilled in the art that other types of computer readable media which can store data that is accessible by a computer, such as magnetic cassettes, flash memory cards, digital video disks

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(DVDs), Bernoulli cartridges, random access memories (RAMs), read only memory (ROM), and the like, may also be used in the exemplary operating environment.

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A number of program modules may be stored on the hard disk, magnetic disk 59, optical disk 61, ROM 54 or RAM 55, including an operating system 65, one or more application programs 66 (which may include PIMs), modules 67 (which may program synchronization component 26), and program data 68. user may enter commands and information into the desktop computer 12 through input devices such as a keyboard 70, pointing device 72, and microphone 92. shown) may include a input devices (not Other joystick, game pad, satellite dish, scanner, or the input devices are often These and other connected to the processing unit 48 through a serial port interface 76 that is coupled to the system bus 52, but may be connected by other interfaces, such as a sound card, a parallel port, game port or a universal serial bus (USB). A monitor 77 or other type of display device is also connected to the system bus 52 via an interface, such as a video adapter 78. In addition to the monitor 77, desktop computers may typically include other peripheral output devices such as speaker 71 and printers.

The desktop computer 12 may operate in a networked environment using logic connections to one or more remote computers (other than mobile device 10), such as a remote computer 79. The remote computer 79 may be another personal computer, a server, a router, a network PC, a peer device or other network node, and typically includes many or all of the elements described above relative to desktop computer

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12, although only a memory storage device 80 has been illustrated in FIG. 5. The logic connections depicted in FIG. 5 include a local area network (LAN) 81 and a wide area network (WAN) 82. Such networking environments are commonplace in offices, enterprisewide computer network intranets and the Internet.

When used in a LAN networking environment, the desktop computer 12 is connected to the local area network 81 through a network interface or adapter 83. When used in a WAN networking environment, the desktop computer 12 typically includes a modem 84 or other means for establishing communications over the wide area network 82, such as the Internet. The modem 84, which may be internal or external, is connected to the system bus 52 via the serial port interface 76. In a network environment, program modules depicted relative to desktop computer 12, or portions thereof, may be stored in the remote memory storage devices. It will be appreciated that the network connections shown are establishing other means of exemplary and communications link between the computers may be used.

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Desktop computer 12 runs operating system 65 that is typically stored in non-volatile memory 54 and executes on the processor 48. One suitable operating system is a Windows brand operating system sold by Microsoft Corporation, such as Windows 95 or Windows NT, operating systems, other derivative versions of Windows brand operating systems, or another suitable operating system. Other suitable operating systems include systems such as the Macintosh OS sold from Apple Corporation, and the OS/2 Presentation Manager sold by International Business Machines (IBM) of Armonk, New York. Application programs can be stored

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in program module 67, in volatile memory or non-volatile memory, or can be loaded into any of the components shown in FIG. 5 from a floppy diskette 59, CDROM drive 61, downloaded from a network via network adapter 83, or loaded using another suitable mechanism.

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diagram illustrating methods of flow invention is shown in FIG. 6. The methods shown in FIG. 6 are described with reference to the exemplary embodiment of a mobile computing device and a desktop computer provided in FIG. 7. FIG. 7 illustrates the recognition the speech separation of extraction process performed in the mobile device 10 from the other speech recognition functions performed In the embodiment illustrated, during in computer 12. speech recognition, speech is provided as an input into the microphone of mobile device 10 in the form of an audible voice signal by the user. This step is illustrated at block 205 of FIG. 6. The microphone 17 converts the audible voice signal into an analog signal which is provided to the A/D converter 101. The A/D converter 101 converts the analog speech signal into a sequence of digital signals, which is provided to the feature extraction module 103. step is illustrated at block 210 of FIG. 6.

Feature extraction module 103, which can considered a "front-end" of the continuous speech provides an output recognition process, as intermediate speech recognition results which transmitted via transceiver 27 and data transport 14 to desktop computer 12 for completion of the speech The particular type process. recognition intermediate result provided by feature extraction

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module 103 are correlated to the type of feature which feature recognition search engine 105 in desktop computer 12 is adapted to utilize. For example, the intermediate speech recognition results provided by feature extraction module 103 can be Mel-Frequency Cepstrum Coefficients (MFCC Coefficients) or Vector Quantized (VQ) indices. The intermediate results can also be Hidden Markov Modeling (HMM) scores, HMM state output probability density functions (pdf), Cepstral coefficients, or other types of speech recognition features which can be extracted from the speech signals.

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In one embodiment, the feature extraction module 103 is a conventional array processor that performs spectral analysis on the digital signals and computes a magnitude value for each frequency band of a In other embodiments, the feature frequency spectrum. extraction module 103 can also encode feature vectors into one or more code words using vector quantization techniques and a codebook derived from training data. Thus, the feature extraction module 103 provides, at its output the feature vectors (or code words) for In some embodiments, the each spoken utterance. are computed by feature results intermediate determining output 103 by extraction module probability distributions computed against Markov Models using the feature vector (or code words) particular frame being analyzed. These be used probability distributions then can executing a Viterbi or similar type of processing technique in desktop computer 12. The extraction functions implemented by feature extraction module 103 are illustrated generally at block 215 of

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the flow diagram shown in FIG. 6. Transmission of the intermediate speech recognition results from mobile computing device 10, and receipt of the intermediate speech recognition results at computer 12 are shown at blocks 220 and 225, respectively, of FIG. 6.

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Since the bandwidth provided by microphone will typically be wider than the bandwidth provided by data transport 14, the internal representations or intermediate results provided by feature extraction module 103 will be more accurate than if the speech signals had been transmitted across transport 14 for feature extraction within computer 12. Since mobile device 10 sends the intermediate speech recognition results corresponding to the wider bandwidth of microphone 17, the speech recognition results provided by speech recognition search engine 105 should be the same as the results obtained if microphone 17 were connected directly to desktop computer 12. Thus, the problem of having different standards between desktop and telephony bandwidths is eliminated.

Illustrated at block 230 of FIG. 6 is the step of performing secondary speech recognition functions on the intermediate speech recognition results, using computer 12, to provide output text representative of Referring to FIG. 7, the audible speech. recognition search engine 105 is implemented as an application program within desktop computer 12, and it recognition " secondary" speech the Acoustic model 107 and language model 109 functions. are stored within the memory of desktop 12. receiving the intermediate speech recognition results extraction module 103, the feature recognition search engine 105 accesses information

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stored in the acoustic model 107. The model 107 stores acoustic models, such as Hidden Markov Models, which represent speech units to be detected by computer 12. In one embodiment, the acoustic model 107 includes a senone tree associated with each Markov state in a Hidden Markov Model. The Hidden Markov models represent, in one illustrative embodiment, phonemes. Based upon the senones in the acoustic model 107, the search engine 105 determines the most likely phonemes represented by the feature vectors (or code words) received from the feature extraction module 103, and hence representative of the utterance received from the user of the system.

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search engine 105 recognition Speech accesses information stored in language model 109. The information received by search engine 105 based upon its accessing of acoustic model 107 can be used in searching language model 109 to determine a word that most likely represents the intermediate speech recognition results received from module 103. acoustic model 107 and language model 109, as well as other speech recognition models or databases of the type known in the art, speech recognition search engine 105 provides output text corresponding to the original vocal signals received by microphone 17 of mobile device 10. The particular methods implemented by speech recognition engine 105 to generate the а function of the internal text as output representations of the speech recognition intermediate from the exemplary embodiments results can vary described above.

As discussed above, the present invention can utilize digital wireless networks using package

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the intermediate speech transmit protocols to recognition results from feature extraction module Transformation of the wide bandwidth speech signals from microphone 17 into intermediate speech recognition results prevents the loss of data which occur when transmitting the signals across This provides unified desktop-quality transport 14. audio speech recognition for mobile computing devices. In some embodiments, the mobile devices of the present invention are "smart" phones which are programmed to operate in two modes. When the user of mobile device 10 is talking to another person, audio signals are transmitted across transport 14. When the user of mobile device 10 is speaking to computer 12 or to other machines, the features provided by feature extraction module 103 are transmitted. Subsequently, desktop computer 12, or the other corresponding machines, will utilize the transmitted features to perform speech recognition.

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Although the present invention has been described with reference to various embodiments, workers skilled in the art will recognize that changes may be made in form and detail without departing from the spirit and scope of the invention.

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#### WHAT IS CLAIMED IS:

1. A method of performing speech recognition, the method comprising:

receiving audible speech at a microphone of a mobile computing device;

converting the audible speech into speech signals using the mobile computing device;

performing preliminary speech recognition

functions on the speech signals using the

mobile computing device to obtain

intermediate speech recognition results; and

transmitting the intermediate speech recognition

results from the mobile computing device to

a second computing device located remotely

from the mobile computing device.

- 2. The method of claim 1, and further comprising: receiving the intermediate speech recognition results at the second computing device; and performing secondary speech recognition functions on the intermediate speech recognition results using the second computing device to provide output text representative of the audible speech.
- 3. The method of claim 2, wherein performing the secondary speech recognition functions on the intermediate speech recognition results using the second computing device further comprises accessing acoustic model information stored in memory of the second computing device to provide the output text representative of the audible speech as a function of the intermediate speech recognition results and of the acoustic model information.

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4. The method of claim 2, wherein performing the secondary speech recognition functions on the intermediate speech recognition results using the second computing device further comprises accessing language model information stored in memory of the second computing device to provide the output text representative of the audible speech as a function of the intermediate speech recognition results and of the language model information.

5. The method of claim 1, wherein converting the audible speech into speech signals at the mobile computing device further comprises:

converting the audible speech signals into analog signals; and

digitizing the analog signals to obtain the speech signals.

- 6. The method of claim 1, wherein performing the preliminary speech recognition functions on the speech signals to obtain the intermediate speech recognition results further comprises performing feature extraction functions on the speech signals to obtain the intermediate speech recognition results indicative of features of the speech signals.
- 7. The method of claim 6, wherein performing preliminary speech recognition functions on the speech signals further comprises determining Mel-Frequency Cepstrum Coefficients from the speech signals, and wherein transmitting the intermediate speech recognition results from the mobile device to the second computing device further comprises transmitting the Mel-Frequency Cepstrum Coefficients from the mobile computing device to the second computing device.

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8. The method of claim 6, wherein performing preliminary speech recognition functions on the speech signals further comprises determining vector quantized indices from the speech signals, and wherein transmitting the intermediate speech recognition results from the mobile device to the second computing device further comprises transmitting the vector quantized indices from the mobile computing device to the second computing device.

- 9. The method of claim 6, wherein performing preliminary speech recognition functions on the speech signals further comprises determining Hidden Markov Modeling (HMM) scores from the speech signals, and wherein transmitting the intermediate speech recognition results from the mobile device to the second computing device further comprises transmitting the HMM scores from the mobile computing device to the second computing device.
- 10. The method of claim 6, wherein performing preliminary speech recognition functions on the speech signals further comprises determining Hidden Markov Modeling (HMM) state output probability density functions from the speech signals, and wherein transmitting the intermediate speech recognition results from the mobile device to the second computing device further comprises transmitting the HMM state output probability density functions from the mobile computing device to the second computing device.
- 11. The method of claim 6, wherein performing preliminary speech recognition functions on the speech signals further comprises determining Cepstral coefficients from the speech signals, and wherein

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transmitting the intermediate speech recognition results from the mobile device to the second computing device further comprises transmitting the Cepstral coefficients from the mobile computing device to the second computing device.

- The method of claim 6, wherein performing preliminary speech recognition functions on the speech signals further comprises determining feature vectors from the speech signals, and wherein transmitting the intermediate speech recognition results from the mobile device to the second computing device further comprises transmitting the feature vectors from the mobile computing device to the second computing device.
- The method of claim 1, wherein transmitting the intermediate speech recognition results further comprises transmitting the intermediate speech recognition results from the mobile computing device to the second computing device over a wireless communications network.
- The method of claim 1, wherein transmitting the intermediate speech recognition results further comprises transmitting the intermediate speech recognition results from the mobile computing device to the second computing device over a communications network having a bandwidth which is less than a bandwidth of the microphone of the mobile computing device.
- 15. A computer-readable medium having mobile computerexecutable instructions for performing the steps of:

implementing preliminary speech recognition functions on speech signals, corresponding to audible speech from a user of a mobile

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computer having a microphone, to obtain intermediate speech recognition results; and sending the intermediate speech recognition results to a transmitter of the mobile computer to transmit the intermediate speech recognition results from the mobile computer to a second computer located remotely from the mobile computer.

The computer readable medium of claim 15, wherein the computer-executable instructions for performing the step of implementing the preliminary speech recognition functions on the speech signals further includes computer-executable instructions for performing feature extraction functions on the speech signals to obtain the intermediate speech recognition results indicative of features of the speech signals. The method of claim 16, wherein the computerexecutable instructions for performing the step of implementing the preliminary speech recognition functions on the speech signals further includes computer-executable instructions for determining Mel-Frequency Cepstrum Coefficients from the speech signals, and wherein the computer-executable instructions for sending the intermediate speech recognition results to the transmitter of the mobile computer further includes computer-executable instructions for sending the Mel-Frequency Cepstrum Coefficients to the transmitter of the mobile computer to transmit the Mel-Frequency Cepstrum Coefficients from the mobile computer to the second computer. The method of claim 16, wherein the computerexecutable instructions for performing the step of implementing the preliminary speech recognition

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functions on the speech signals further includes computer-executable instructions for determining vector quantized indices from the speech signals, and wherein the computer-executable instructions for sending the intermediate speech recognition results to the transmitter of the mobile computer further includes computer-executable instructions for sending the vector quantized indices to the transmitter of the mobile computer to transmit the vector quantized indices from the mobile computer to the second computer.

- 19. The method of claim 16, wherein the computerexecutable instructions for performing the step of
  implementing the preliminary speech recognition
  functions on the speech signals further includes
  computer-executable instructions for determining
  Hidden Markov Modeling (HMM) scores from the speech
  signals, and wherein the computer-executable
  instructions for sending the intermediate speech
  recognition results to the transmitter of the mobile
  computer further includes computer-executable
  instructions for sending the HMM scores to the
  transmitter of the mobile computer to transmit the HMM
  scores from the mobile computer to the second
  computer.
- 20. The method of claim 16, wherein the computerexecutable instructions for performing the step of
  implementing the preliminary speech recognition
  functions on the speech signals further includes
  computer-executable instructions for determining
  Hidden Markov Modeling (HMM) state output probability
  density functions from the speech signals, and wherein
  the computer-executable instructions for sending the

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intermediate speech recognition results to the transmitter of the mobile computer further includes computer-executable instructions for sending the HMM state output probability density functions to the transmitter of the mobile computer to transmit the HMM state output probability density functions from the mobile computer to the second computer. 21. The method of claim 16, wherein the computerexecutable instructions for performing the step of implementing the preliminary speech recognition functions on the speech signals further includes computer-executable instructions for determining Cepstral coefficients from the speech signals, and wherein the computer-executable instructions for sending the intermediate speech recognition results to the transmitter of the mobile computer further includes computer-executable instructions for sending the Cepstral coefficients to the transmitter of the mobile computer to transmit the Cepstral coefficients from the mobile computer to the second computer. The method of claim 16, wherein the computerexecutable instructions for performing the step of implementing the preliminary speech recognition functions on the speech signals further includes computer-executable instructions for determining feature vectors from the speech signals, and wherein the computer-executable instructions for sending the intermediate speech recognition results to the transmitter of the mobile computer further includes computer-executable instructions for sending the feature vectors to the transmitter of the mobile

computer to transmit the feature vectors from the

mobile computer to the second computer.

- 23. A mobile computer comprising:
  - a microphone adapted to convert audible speech
     into analog signals;
  - an analog-to-digital converter coupled to the microphone and adapted to digitize the audible speech to provide speech signals;
  - a feature extraction module adapted to perform preliminary speech recognition functions on the speech signals to provide intermediate speech recognition results; and
  - a transmitter coupled to the feature extraction module and adapted to transmit the intermediate speech recognition results from the mobile computer to a second computer located remotely from the mobile computer.
- 24. The mobile computer of claim 23, wherein the feature extraction module is adapted to determine from the speech signals Mel-Frequency Cepstrum Coefficients and to provide the Mel-Frequency Cepstrum Coefficients as the intermediate speech recognition results.
- 25. The mobile computer of claim 23, wherein the feature extraction module is adapted to determine from the speech signals vector quantized indices and to provide the vector quantized indices as the intermediate speech recognition results.
- 26. The mobile computer of claim 23, wherein the feature extraction module is adapted to determine from the speech signals Hidden Markov Modeling (HMM) scores and to provide the HMM scores as the intermediate speech recognition results.
- 27. The mobile computer of claim 23, wherein the feature extraction module is adapted to determine from

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the speech signals Hidden Markov Modeling (HMM) state output probability density functions and to provide the HMM state output probability density functions as the intermediate speech recognition results.

- 28. The mobile computer of claim 23, wherein the feature extraction module is adapted to determine from the speech signals Cepstral coefficients and to provide the Cepstral coefficients as the intermediate speech recognition results.
- 29. The mobile computer of claim 23, wherein the feature extraction module is adapted to determine from the speech signals feature vectors and to provide the feature vectors as the intermediate speech recognition results.

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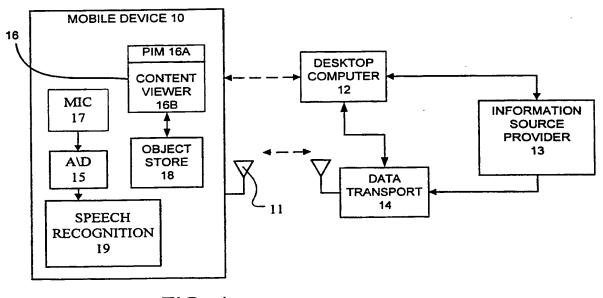
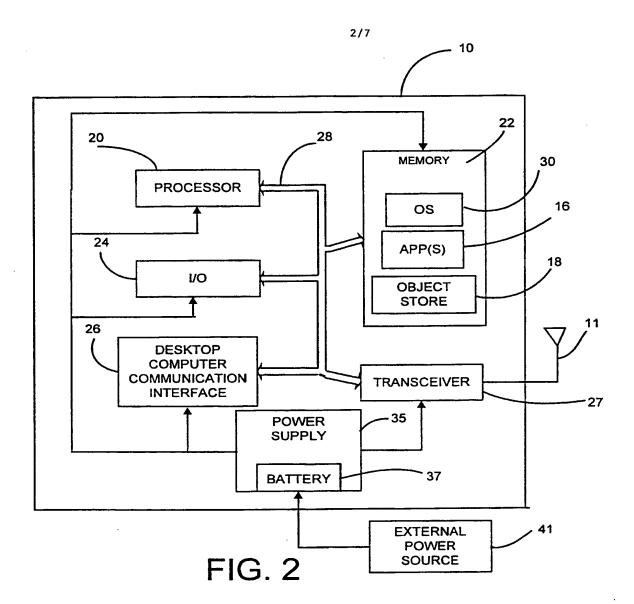
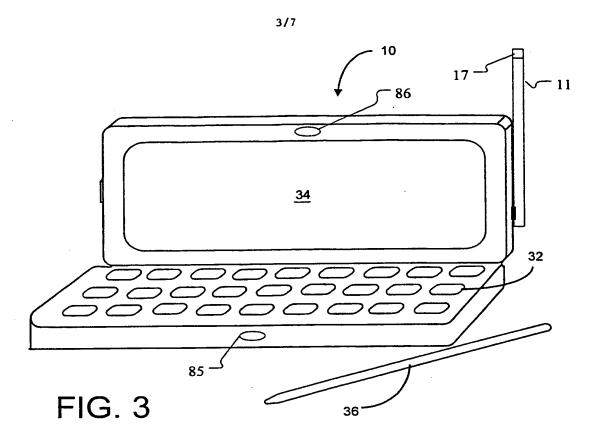


FIG. 1







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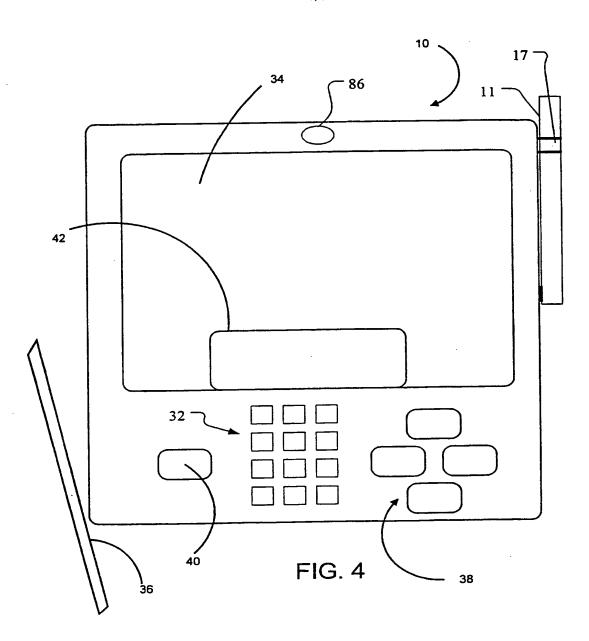
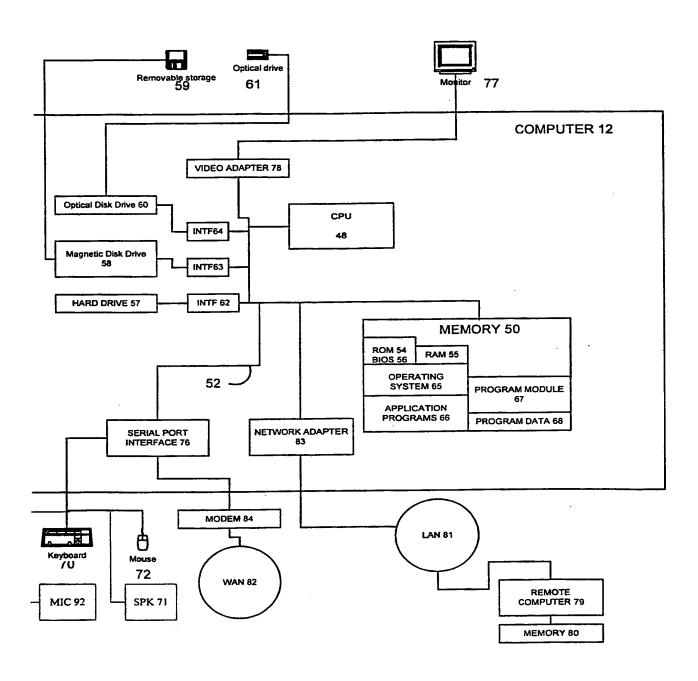




FIG. 5





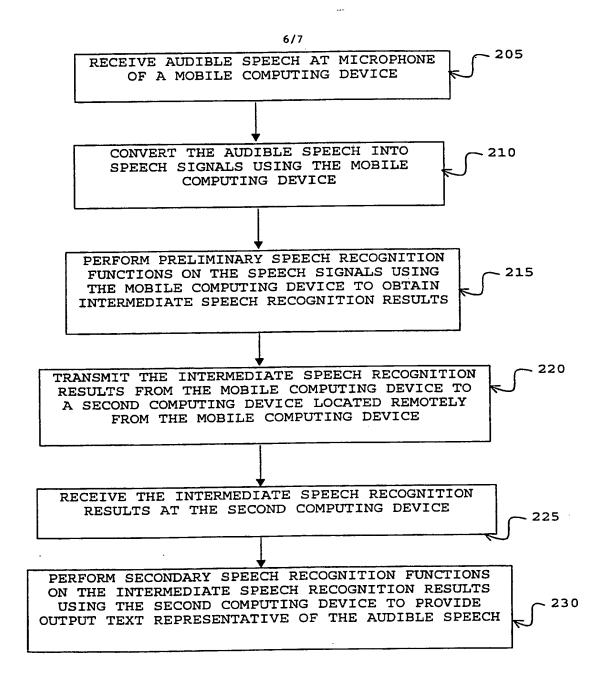


FIG. 6



